

*MODIS Science Team Meeting, June 6-10, 2016, Silver Spring, MD*

# **Daily Monitoring of Crop Condition and Water Use using MODIS, Landsat and Geostationary Data**

**Feng Gao<sup>1</sup>, Martha Anderson<sup>1</sup>, Christopher Hain<sup>2</sup>, Liang Sun<sup>1</sup>,  
Yang Yang<sup>1</sup>, Yun Yang<sup>1</sup>, Bill Kustas<sup>1</sup>, Joe Alfieri<sup>1</sup>, Rick Mueller<sup>3</sup>,  
Zhengwei Yang<sup>3</sup>, Dave Johnson<sup>3</sup>, Xiaoyang Zhang<sup>4</sup>**

1. USDA-Agricultural Research Service , HRSL
2. University of Maryland and NOAA NESDIS
3. USDA National Agricultural Statistics Service
4. South Dakota State University

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## TOOLS

STARFM

Multi-sensor data fusion

DMS

Thermal image sharpening

ALEXI

Multi-scale ET modeling

## ASSETS

GEO

Hourly

SW/TIR  
5km/5km

MODIS

Daily

250m/1km

Landsat

16 day

30m/100m

Lsat-like

~20-60m/ --

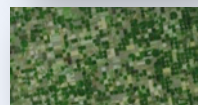
**Objective:** map crop progress, water use, and drought impacts at 30-m spatial resolution by fusing **MODIS, Landsat and geostationary satellites**

## APPLICATIONS

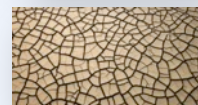
(daily/30 m)



Crop phenology metrics



Crop water use (Evapotranspiration)



Crop stress (drought early warning)

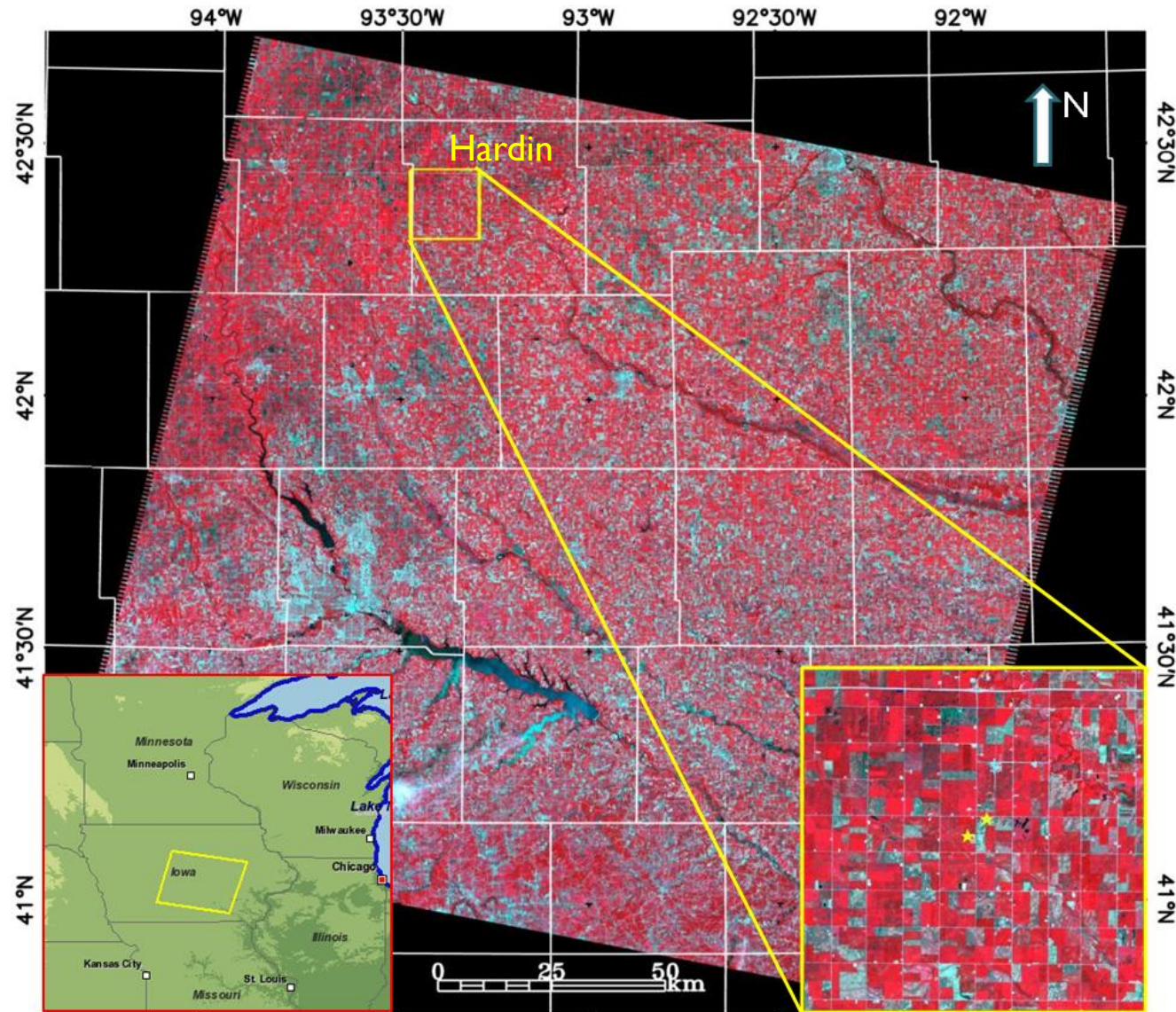


Impact on yield

# Progress and Plan

- ❖ Year 1: Tools Development and System Integration
  - ❖ STARFM data fusion system automation
  - ❖ Evapotranspiration (ET) model integration and system automation
  - ❖ Crop phenology programs evaluation
- ❖ Year 2: System Testing and Results Validation
  - ❖ a rain-fed agricultural area in central Iowa
  - ❖ a vineyard field experiment (GRAPEX) site in Lodi, CA
  - ❖ a managed pine plantation in NC
  - ❖ a tile-drained agricultural landscape in SD
  - ❖ an irrigated agricultural system in the Central Sands or WI
  - ❖ the Walnut Gulch watershed, AZ
  - ❖ several ARS Long-Term Agricultural Research (LTAR) sites including Mead, NE, the OPE3 and Choptank watershed sites in the lower Chesapeake Bay
- ❖ Year 3: Application Extension and Yield Impact

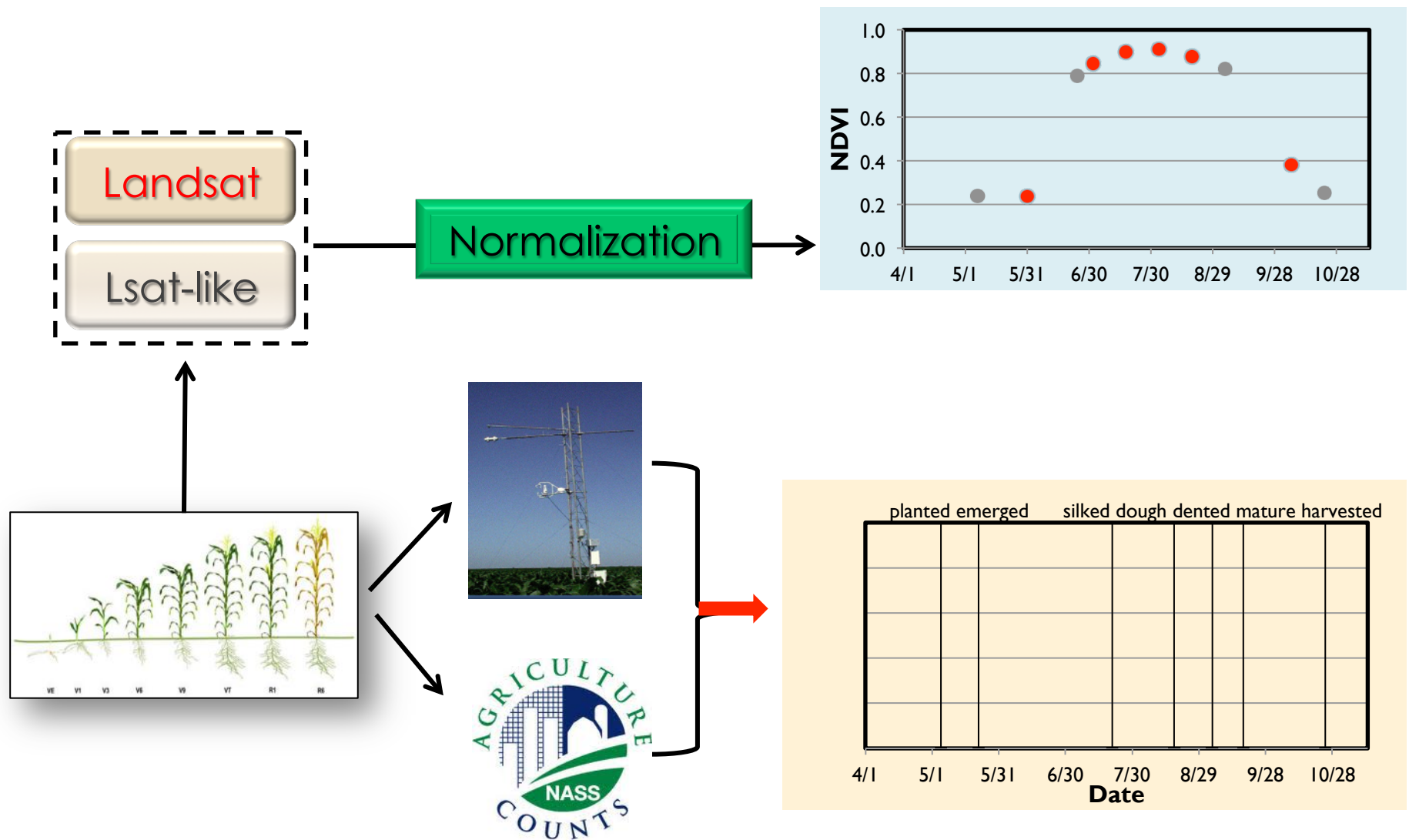
# Case I: central Iowa (~20 counties)



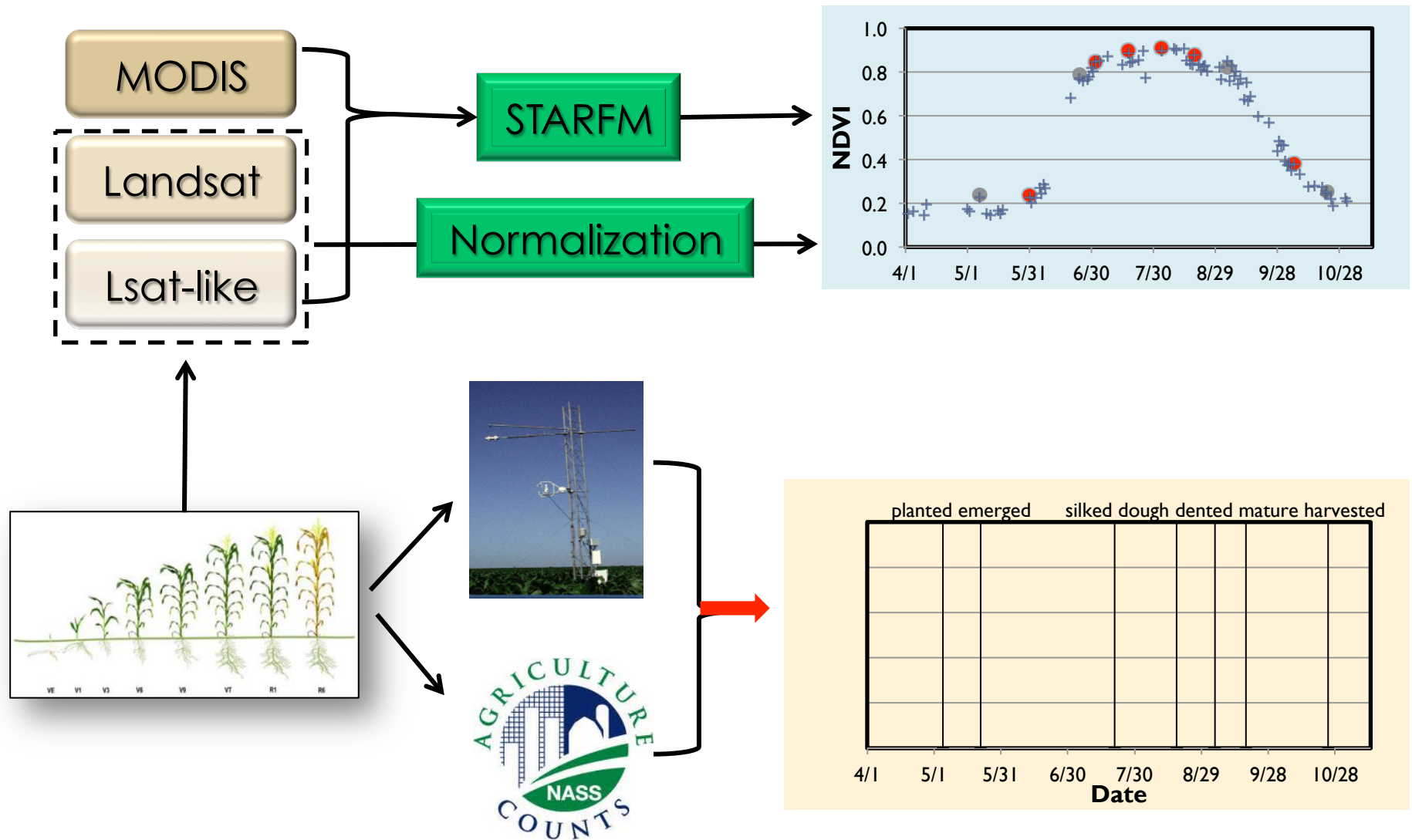
Fourteen years (2001-2014) of Landsat TM, ETM+ and OLI (p26r3l) and MODIS (h10v04 and h11v04) were fused to generate daily Landsat-MODIS surface reflectance at 30m resolution using STARFM



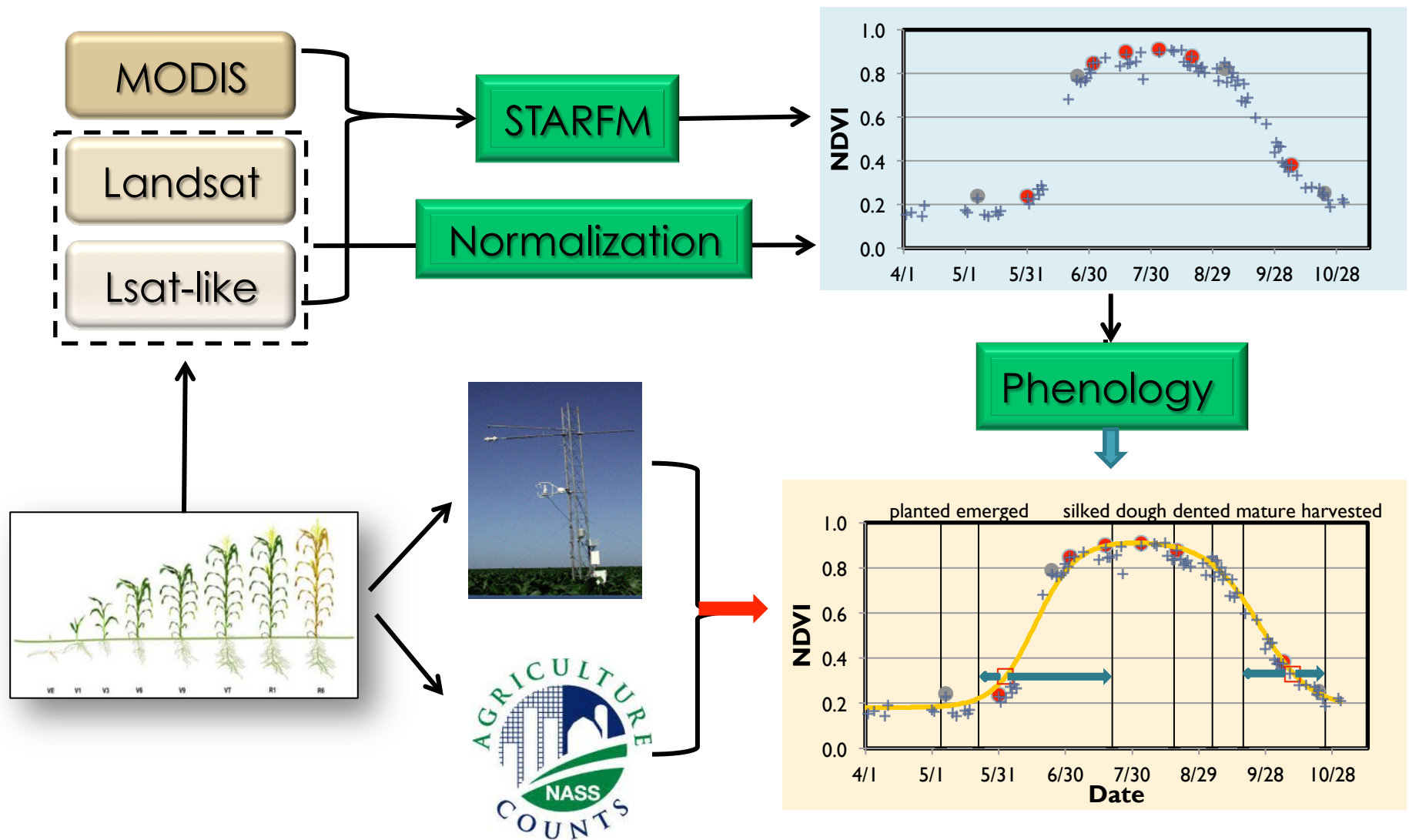
# Mapping Crop Growth Stages using MODIS & Landsat



# Mapping Crop Growth Stages using MODIS & Landsat

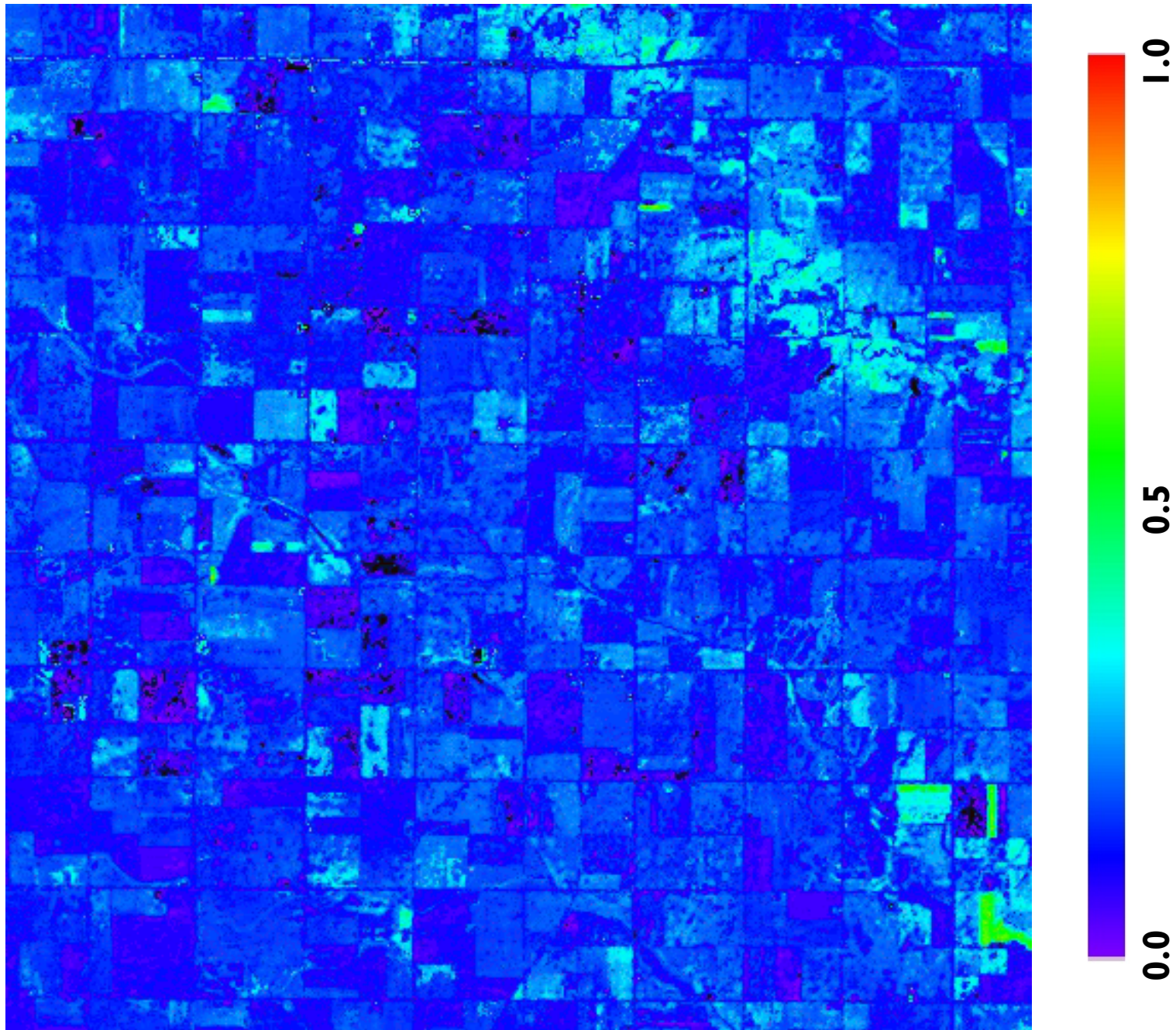


# Mapping Crop Growth Stages using MODIS & Landsat





## Crop Condition and Water Use Monitoring



Smoothed (double logistic function) Daily NDVI, Apr. 1 – Nov. 1, 2011

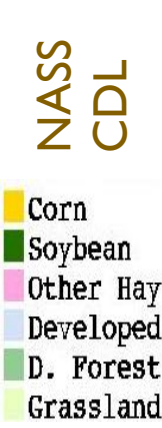
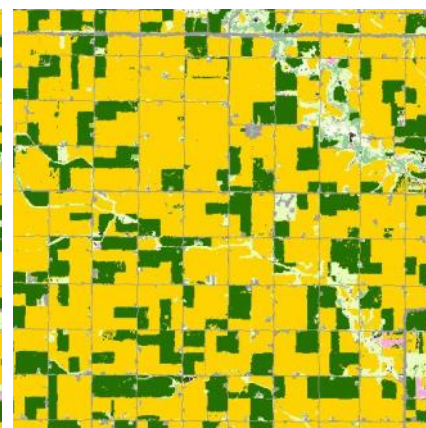
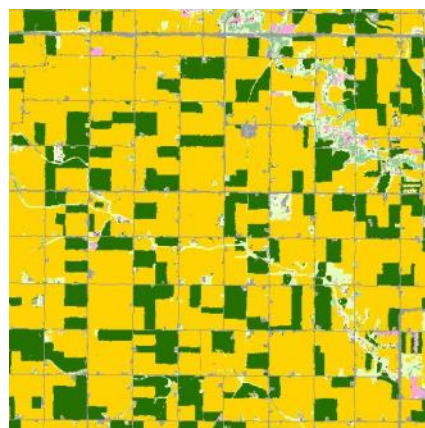
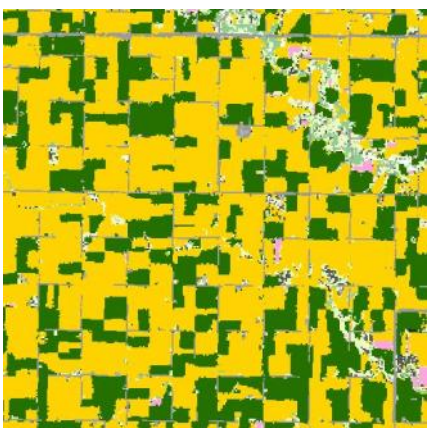
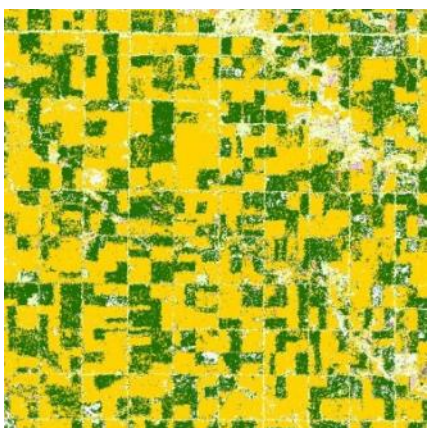
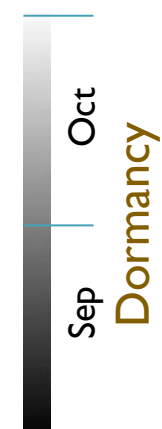
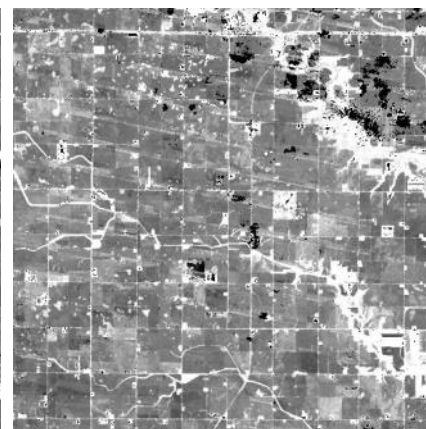
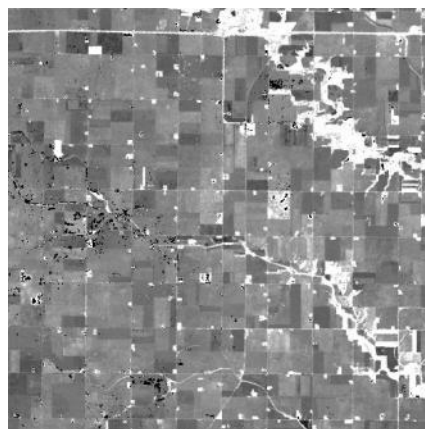
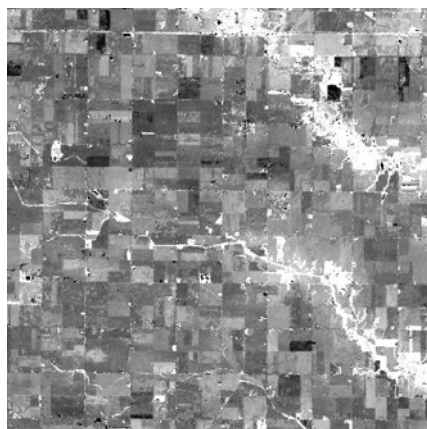
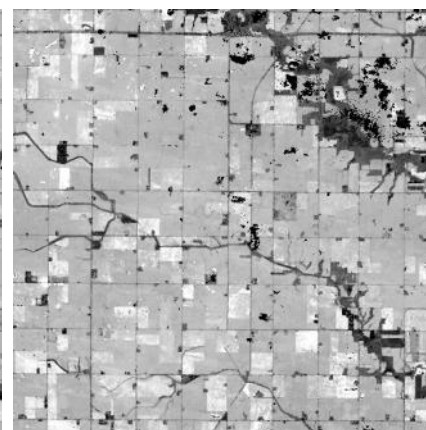
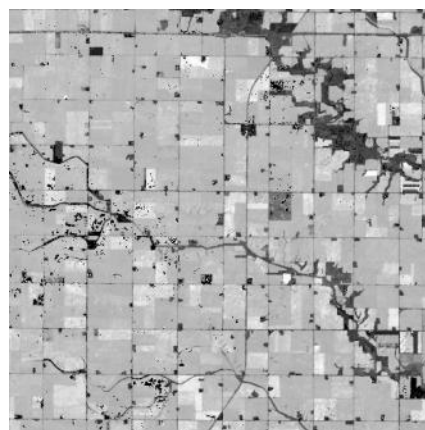
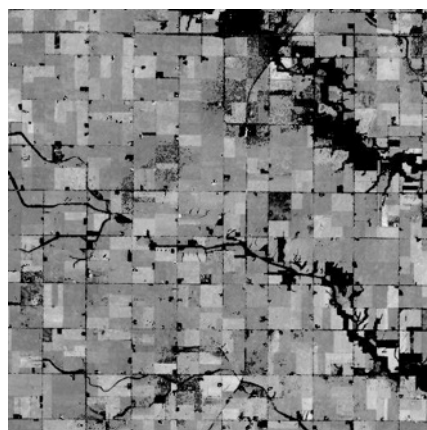
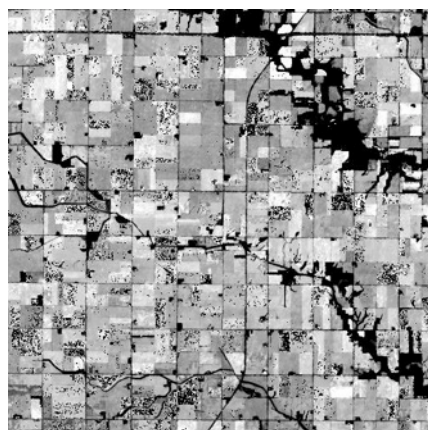


2001

2006

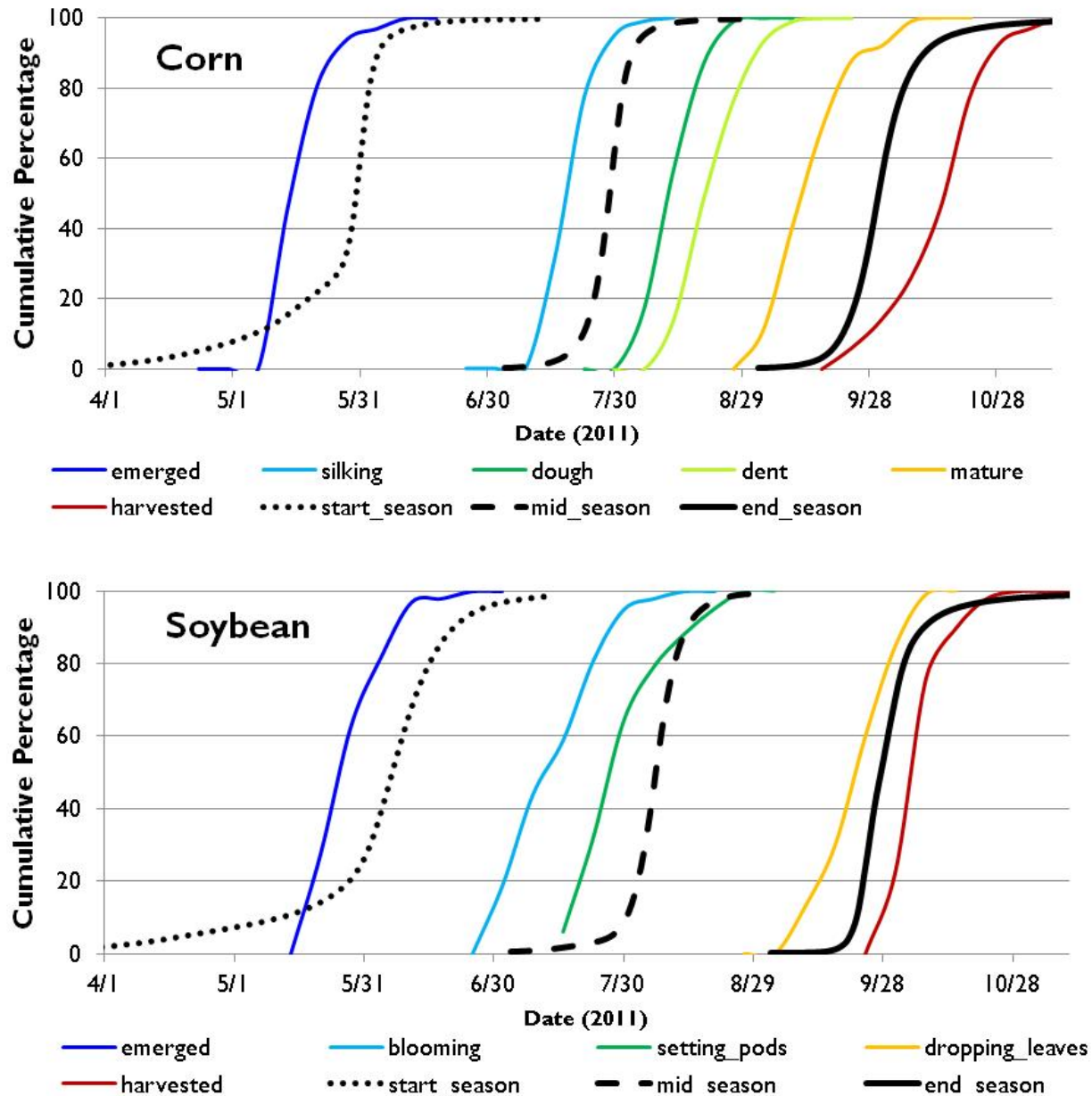
2011

2014



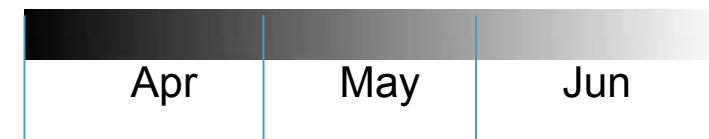
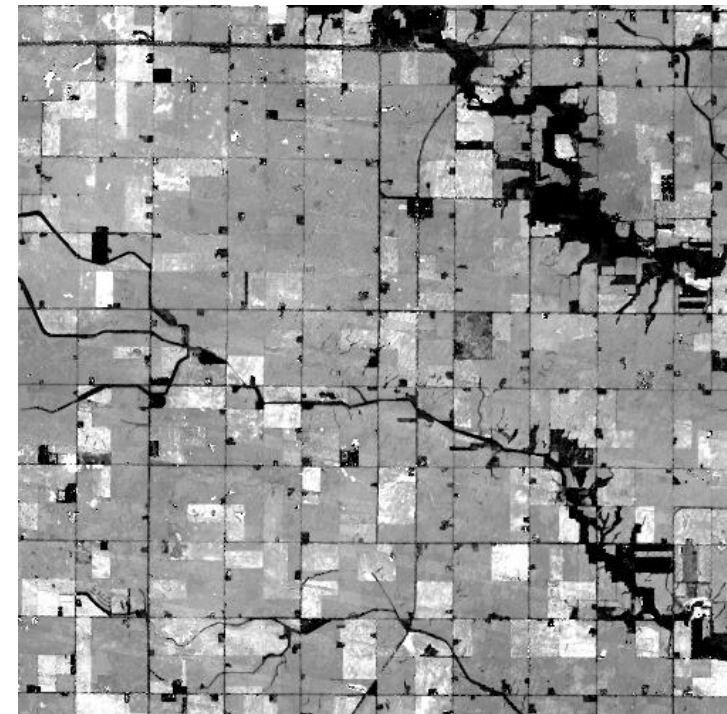
crop growth stages from central Iowa (online 2011 ICP reports)

## Phenology (RS) vs. Crop Growth Stages (NASS)

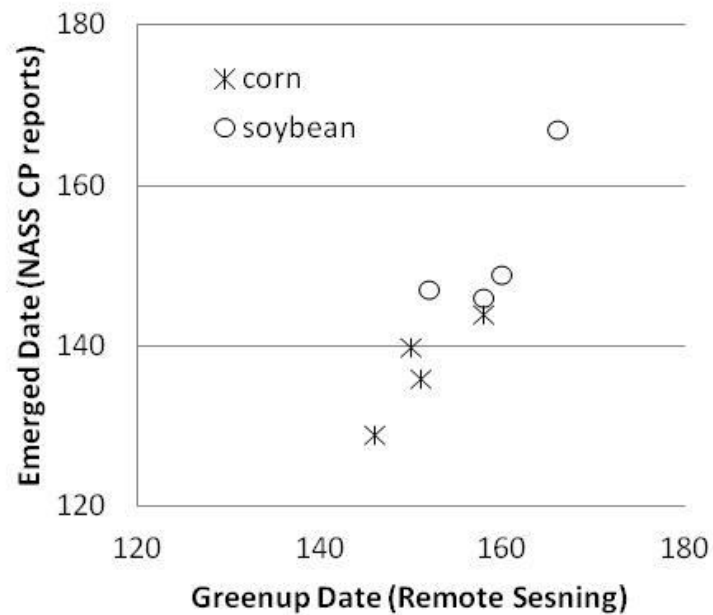
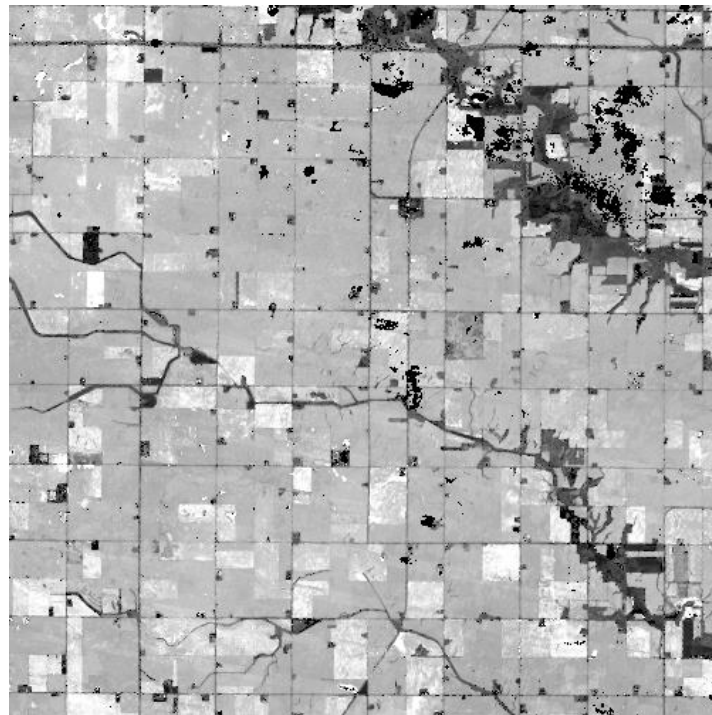




# Remote Sensing Phenology to Crop Growth Stages



Backcast Emerged Date (2014)

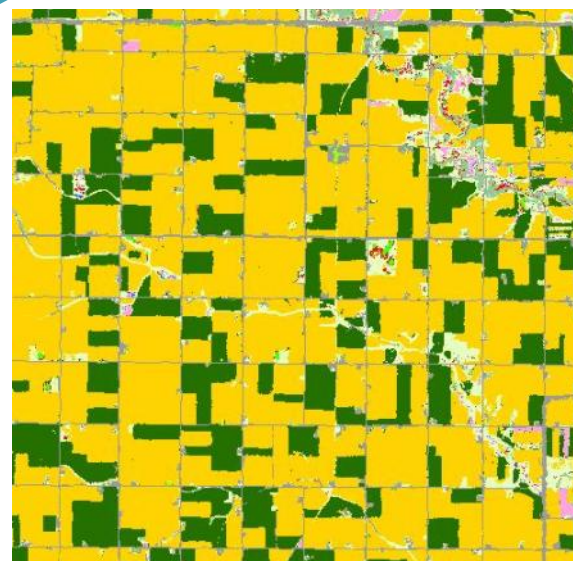
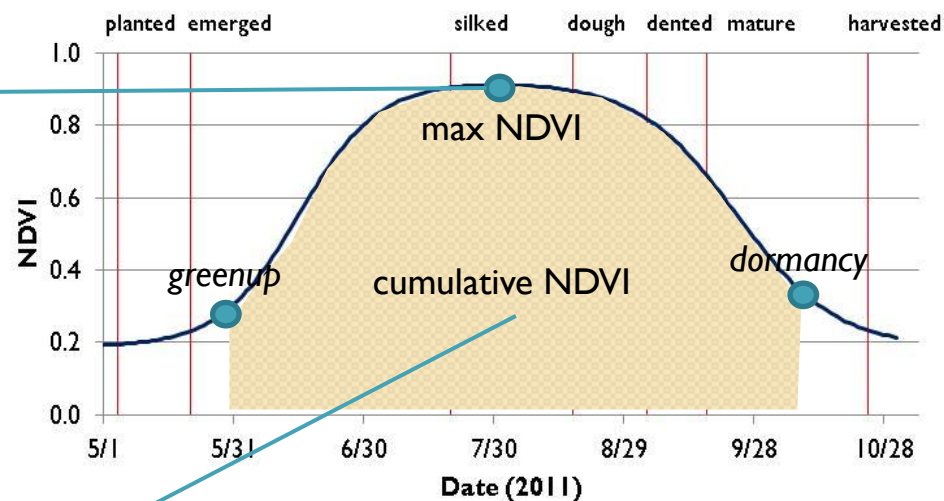
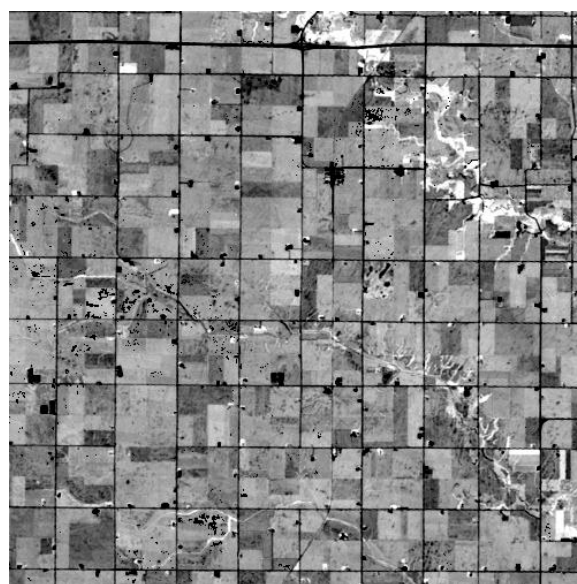
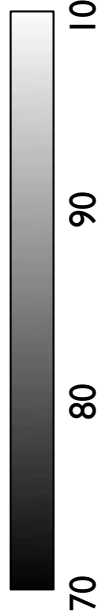
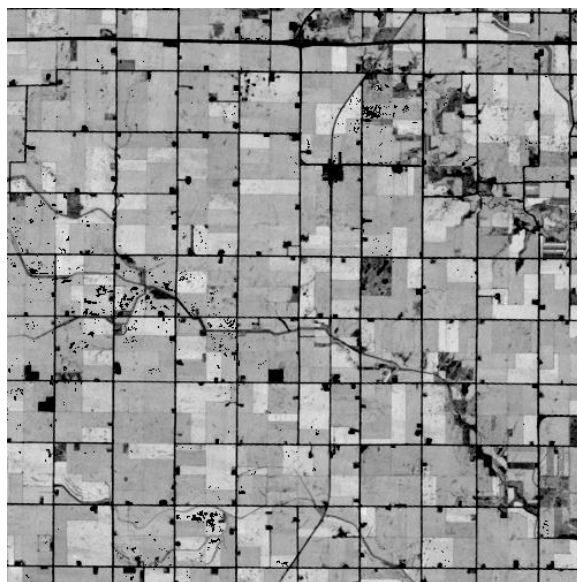
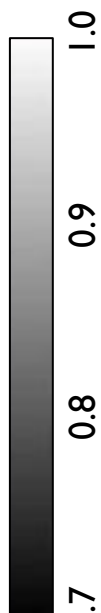


Greenup date

Relationship from previous years

$$Yield = \sum [PAR_i \times fPAR_i \times LUE_i(\epsilon_{max}, T, ET)] * HI$$

$$fPAR_i = f(NDVI_i)$$

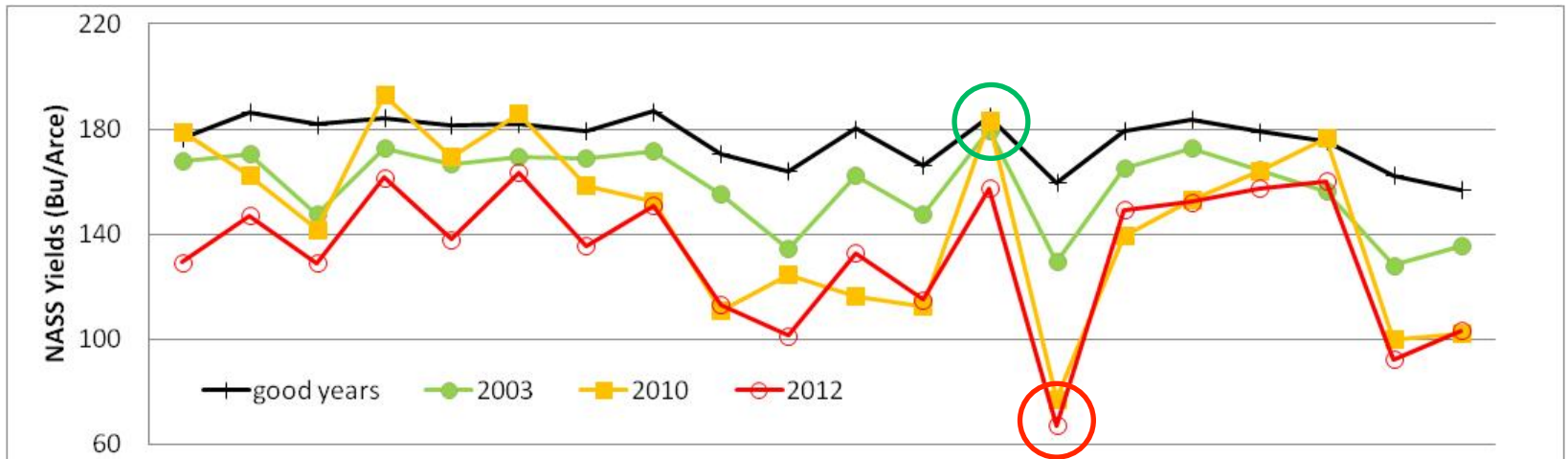


NASS  
CDL  
(2011)

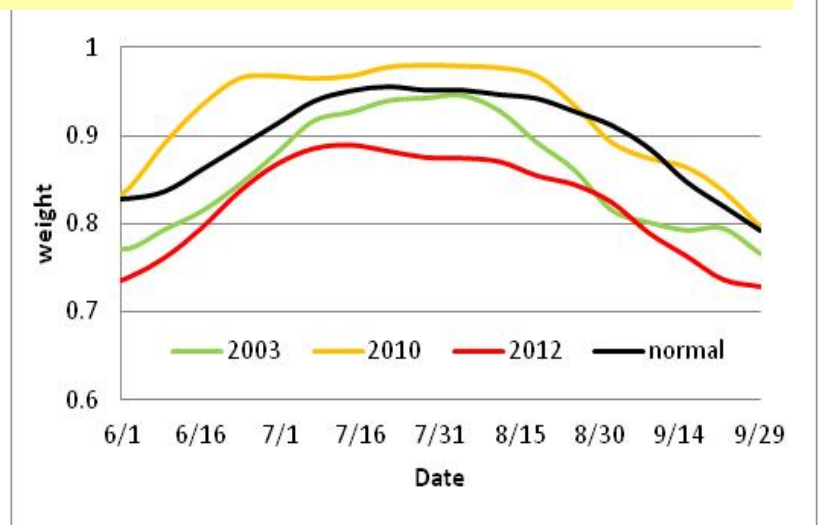
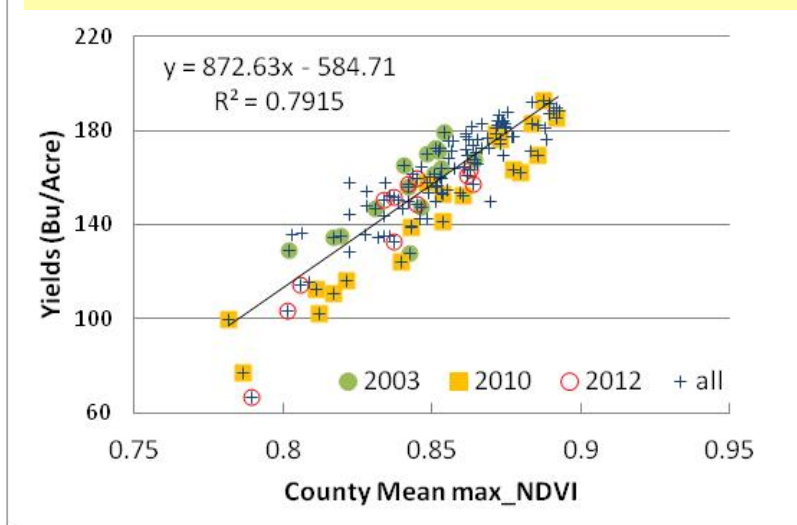
- Corn
- Soybean
- Other Hay
- Developed
- D. Forest
- Grassland



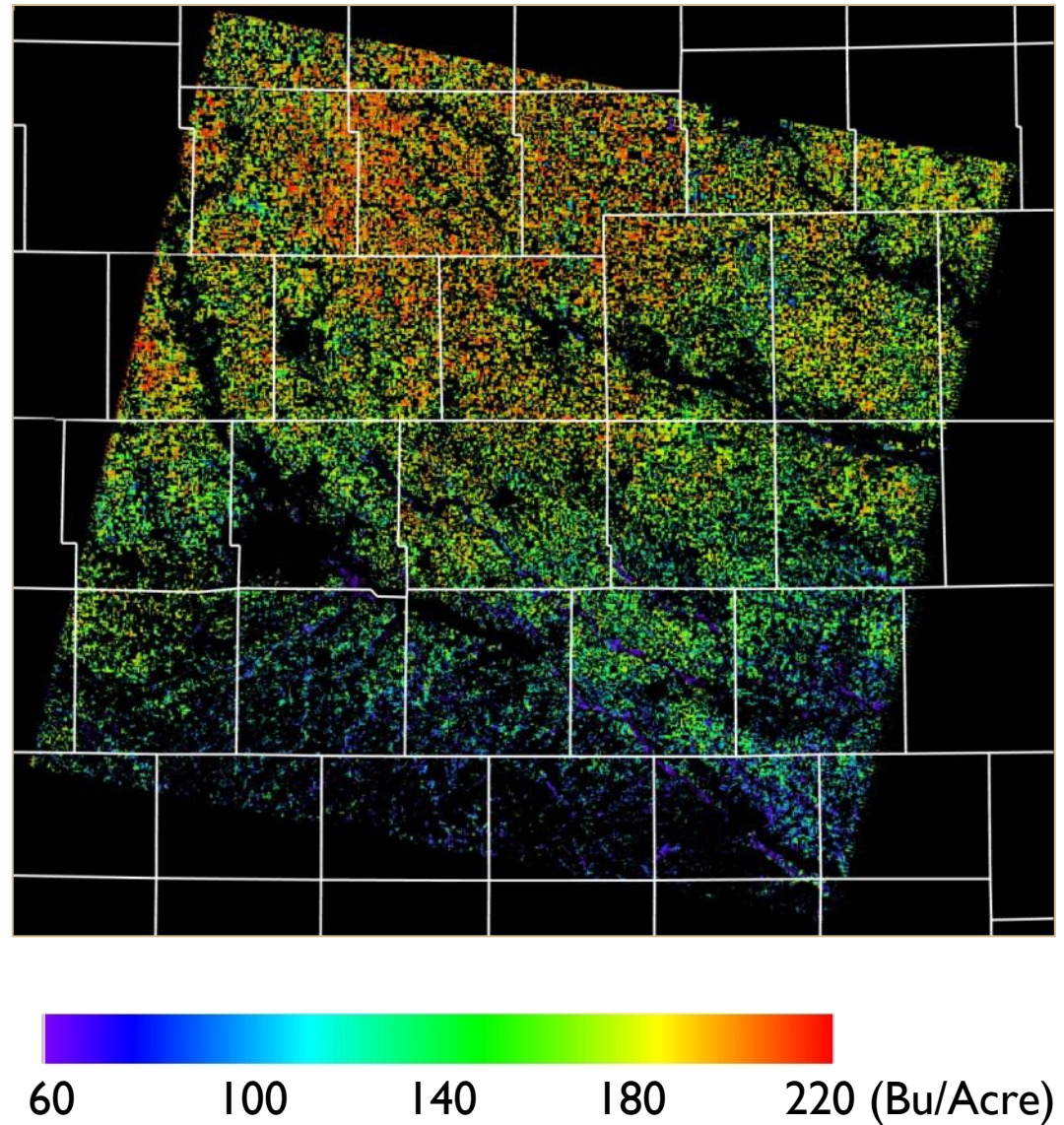
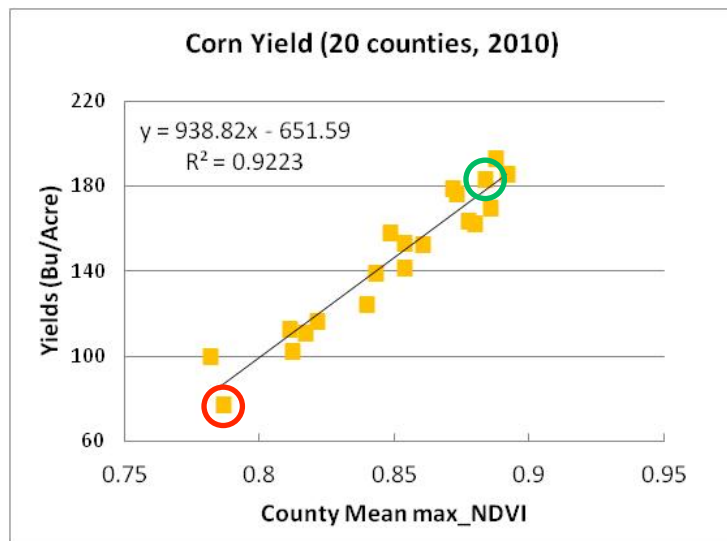
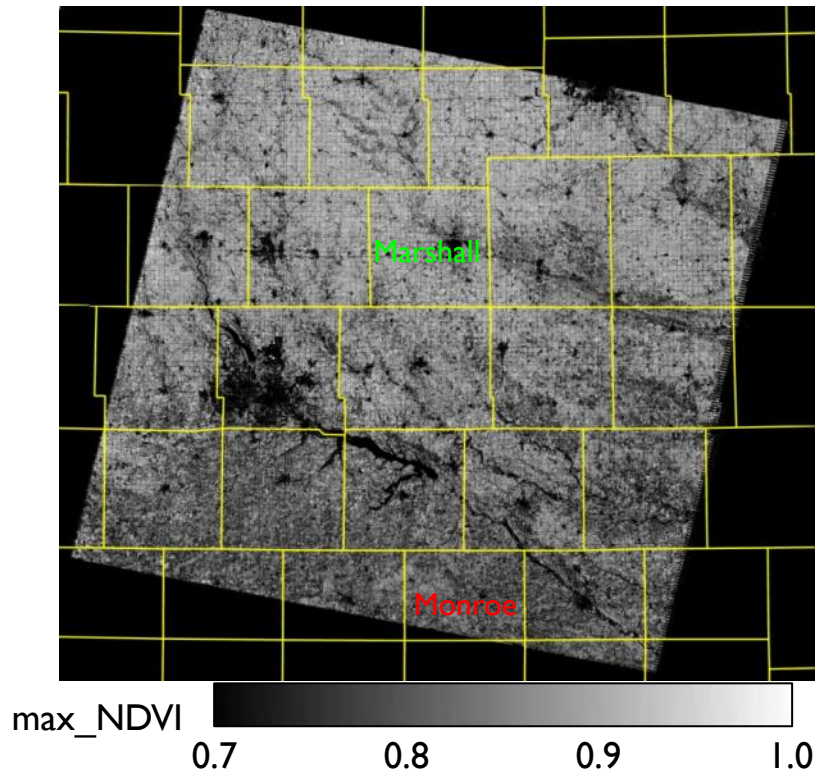
# Corn yields and NDVI metrics (county level)



$$Yield = \sum [PAR_i \times fPAR_i \times LUE_i(\epsilon_{max}, T, ET)] * HI$$

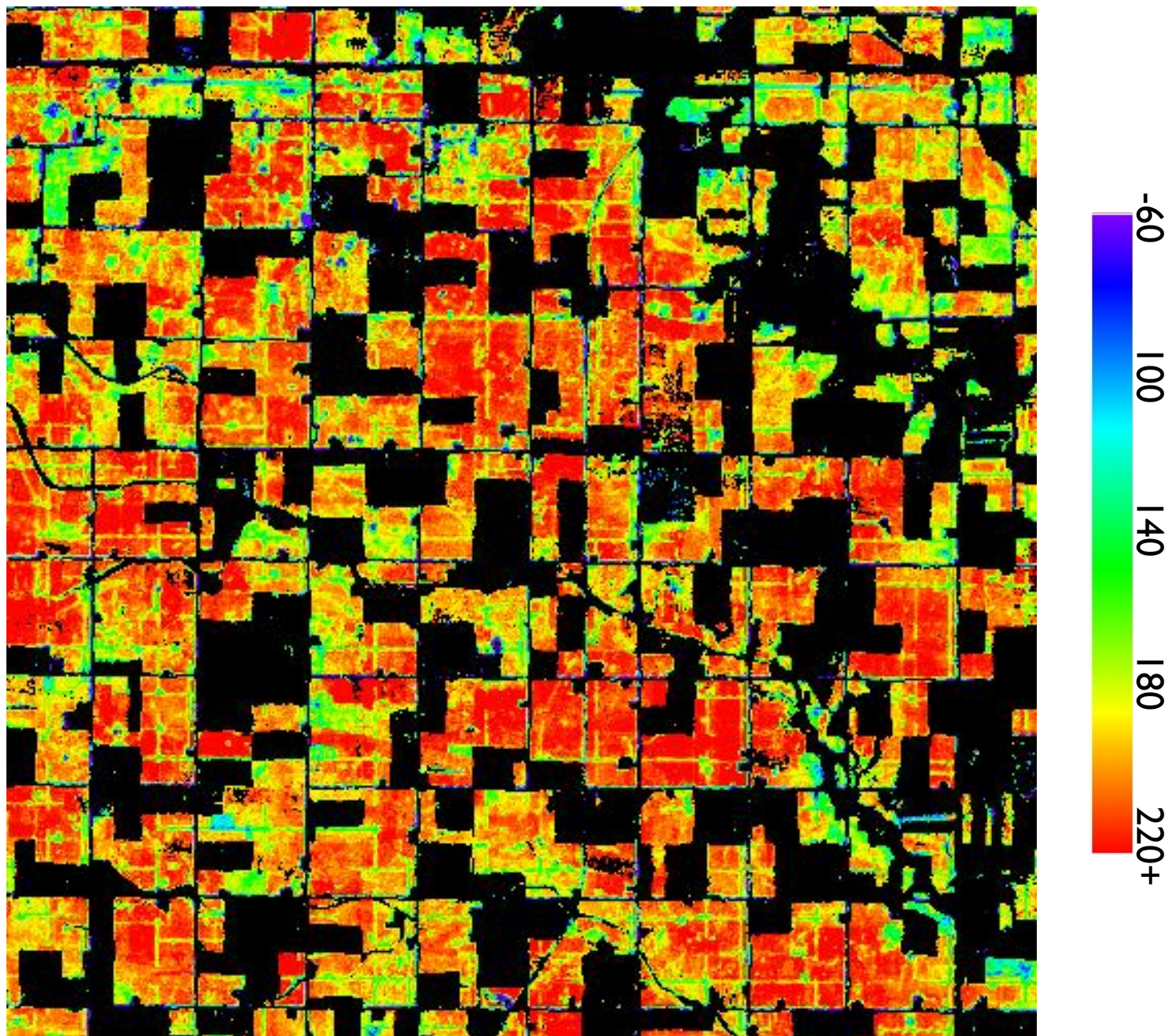


## Estimated Yields at Field Scale (corn, central Iowa, 2010)

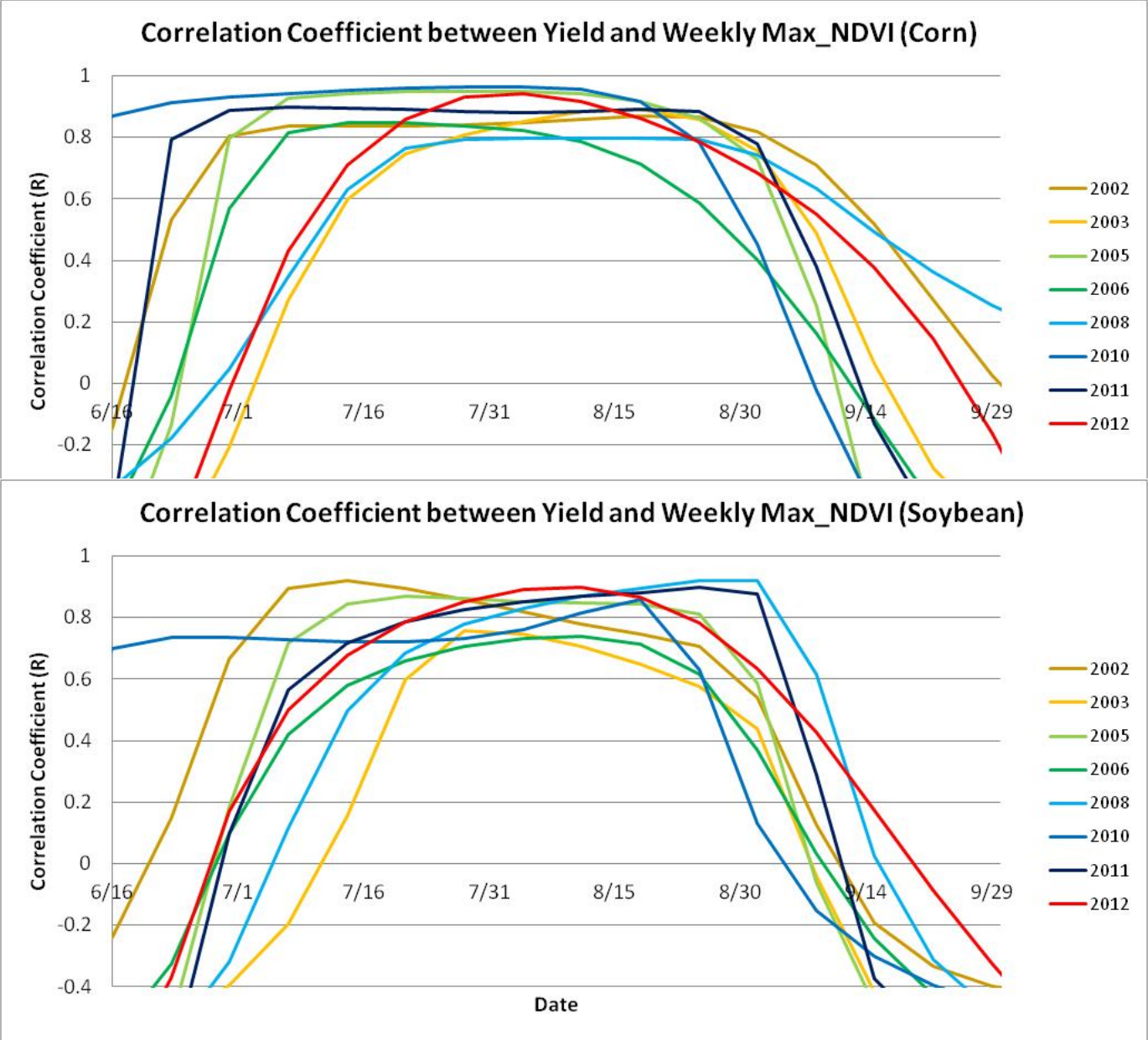




## 2010 Corn Yields (Bu/Acre) at South Fork



# Acquisition Dates are Critical for Yield Modeling





## Case 2: Gallo Vineyards, Lodi CA

(Grape Remote sensing Atmospheric Profiling & Evapotranspiration eXperiment)



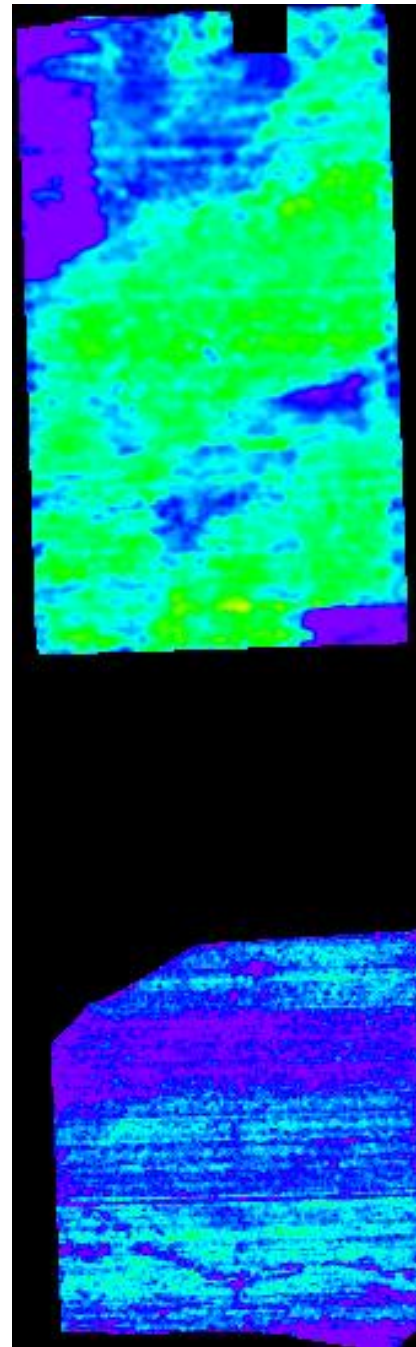
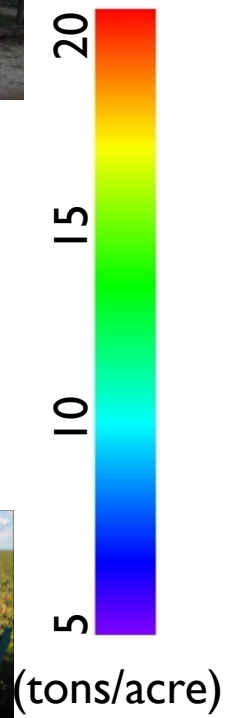
The two vineyards were heavily instrumented to measure meteorological, vegetation, and soil conditions including:

- meteorological quantities, e.g. wind speed, air temperature, and precipitation.
- surface energy balance.
- wind and friction velocity profiles.
- surface/canopy temperature.
- vine water use via sap flow sensors.
- soil temperature/moisture at multiple depths.
- leaf area index
- grape yield

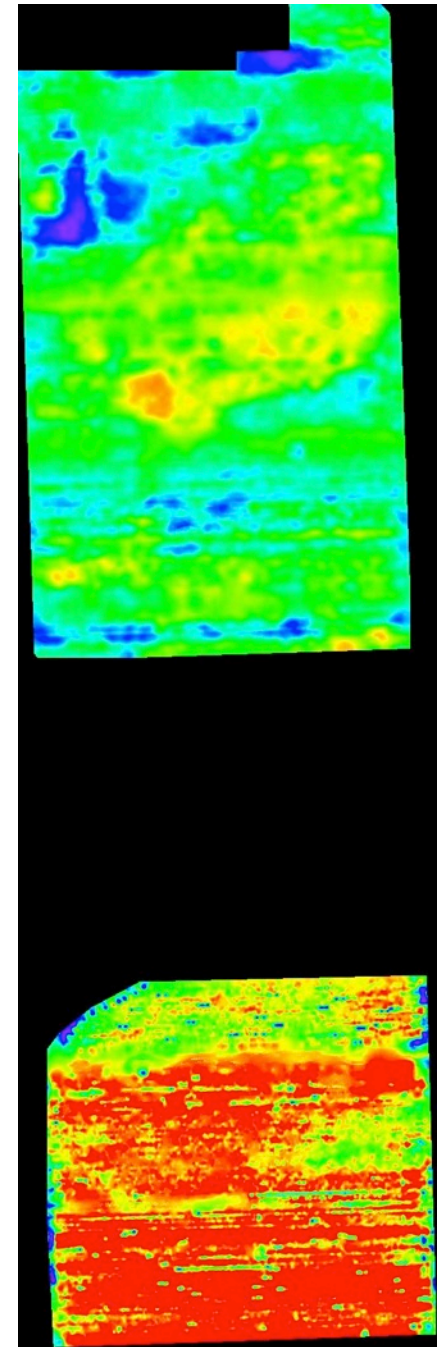
Field measurements and remote sensing data were collected from 2013 to 2016



# Yield Monitoring

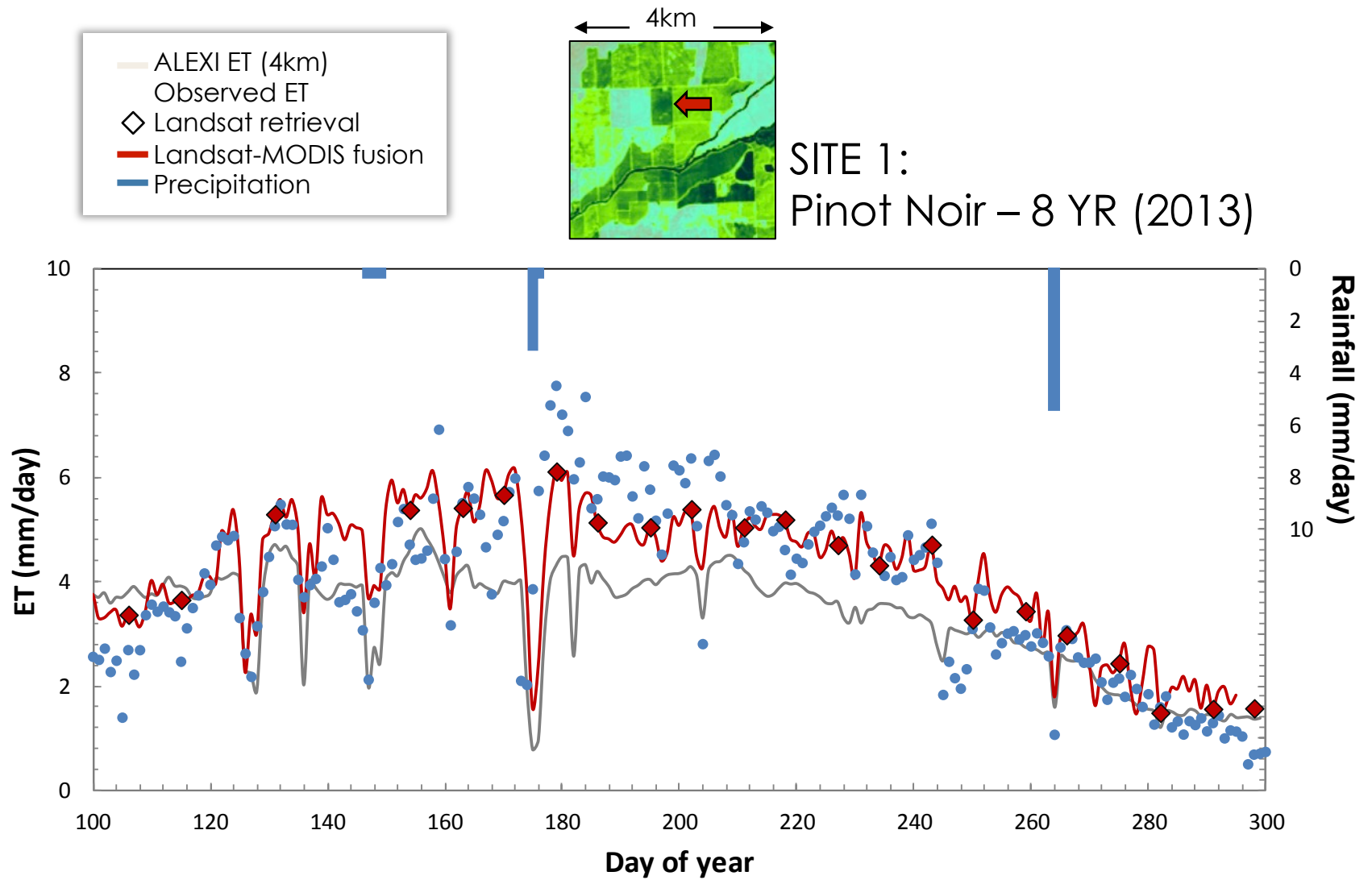


2013 (3m)



2014 (1m)

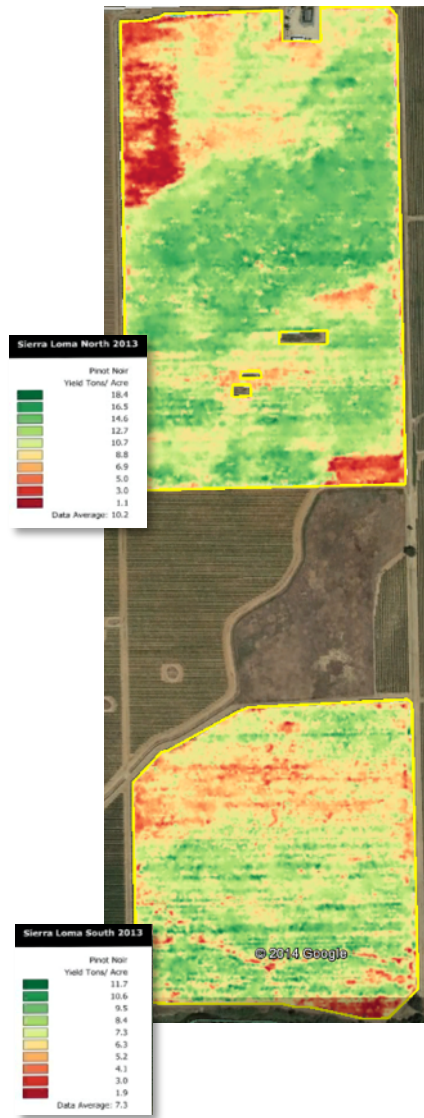
# Crop Condition and Water Use Monitoring





# Crop Condition and Water Use Monitoring

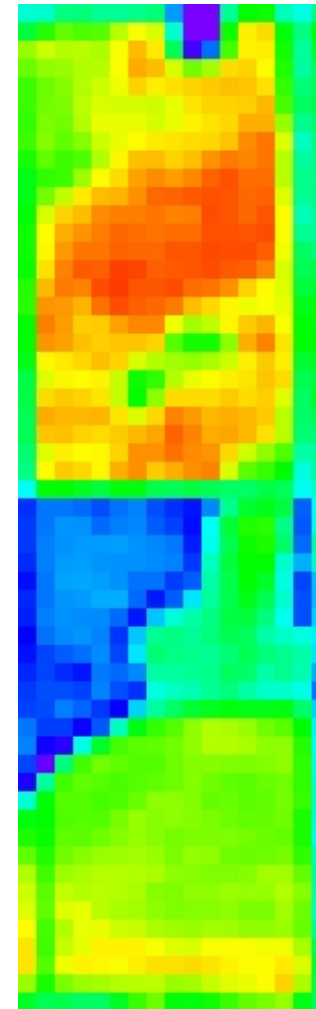
2013 Yield



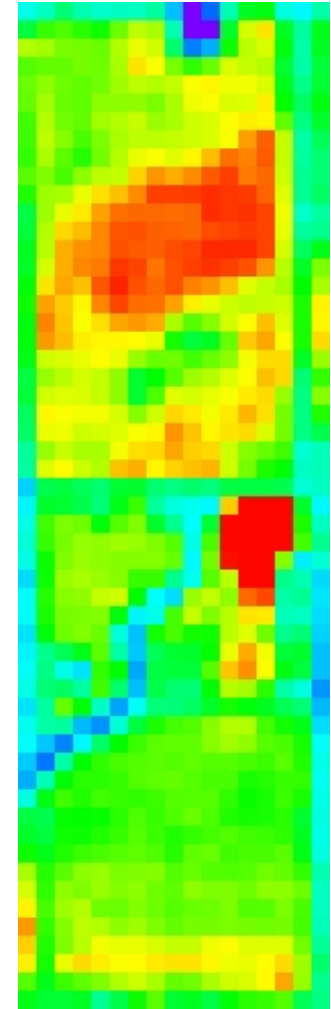
Landsat (30m)



Cumulative ET



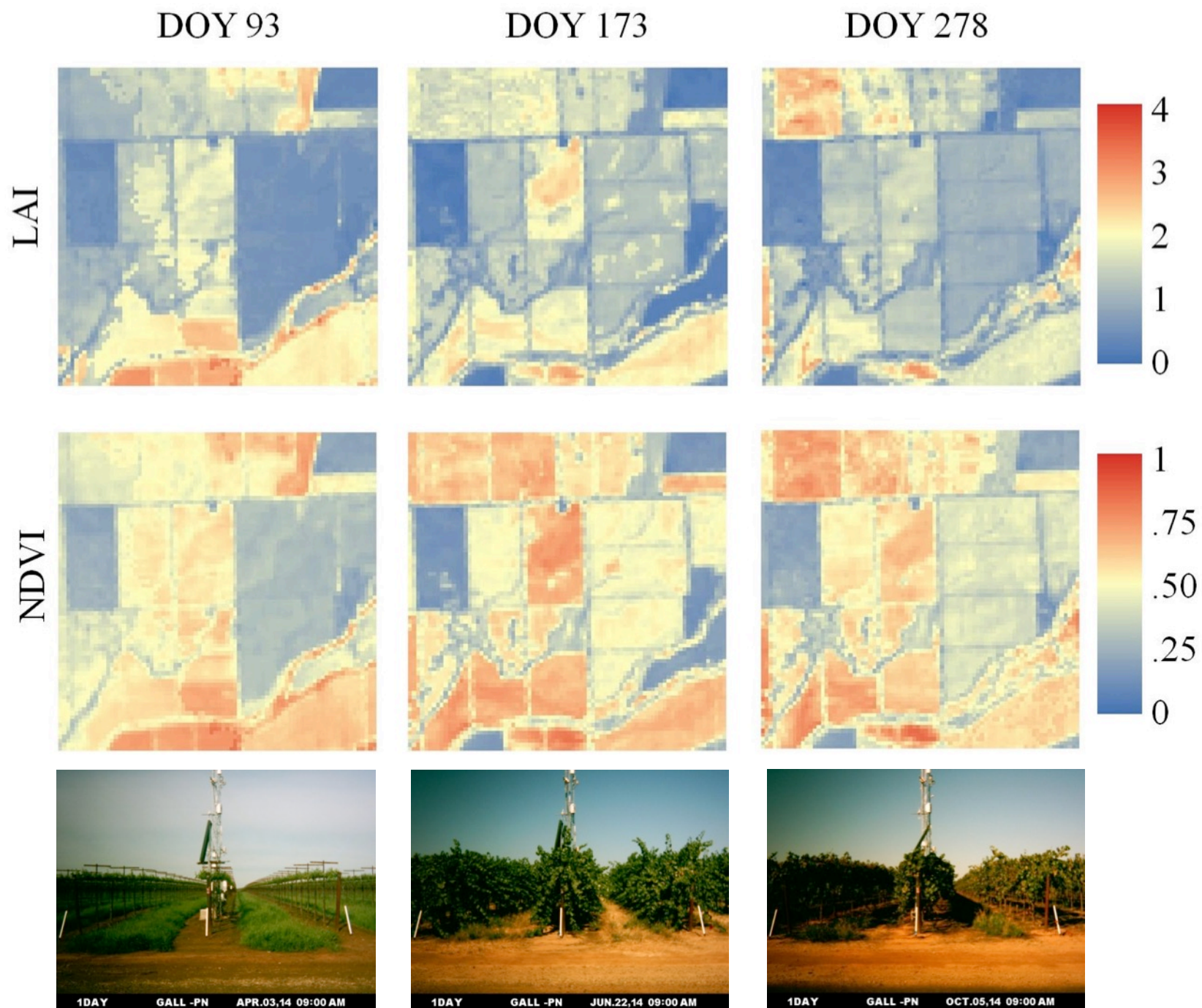
Cumulative LAI



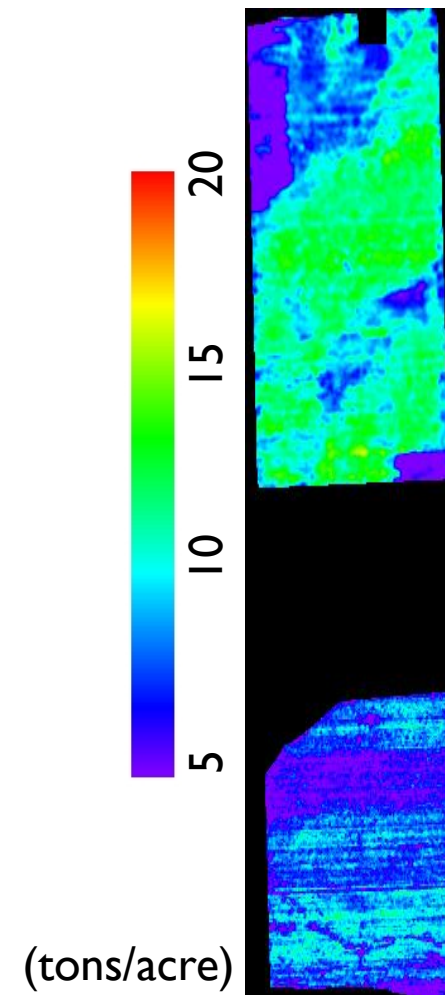
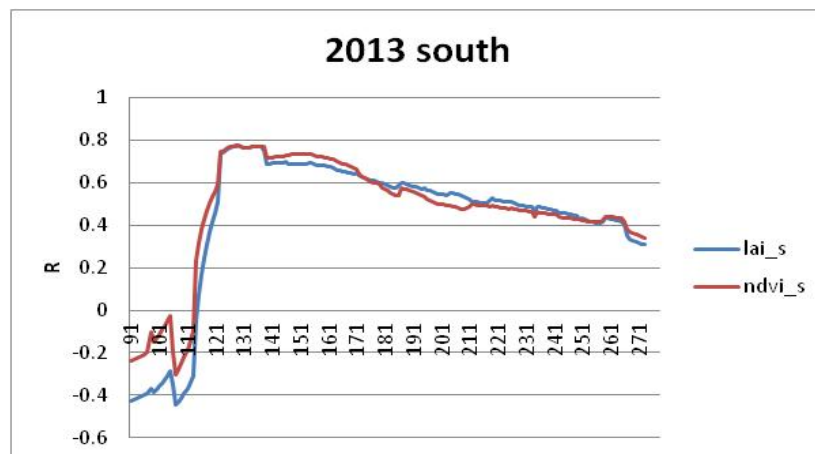
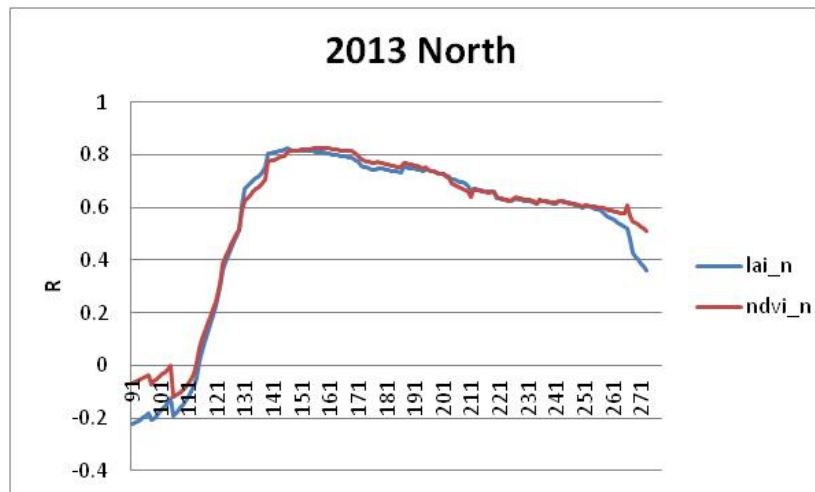
Max LAI



# Crop Condition and Water Use Monitoring

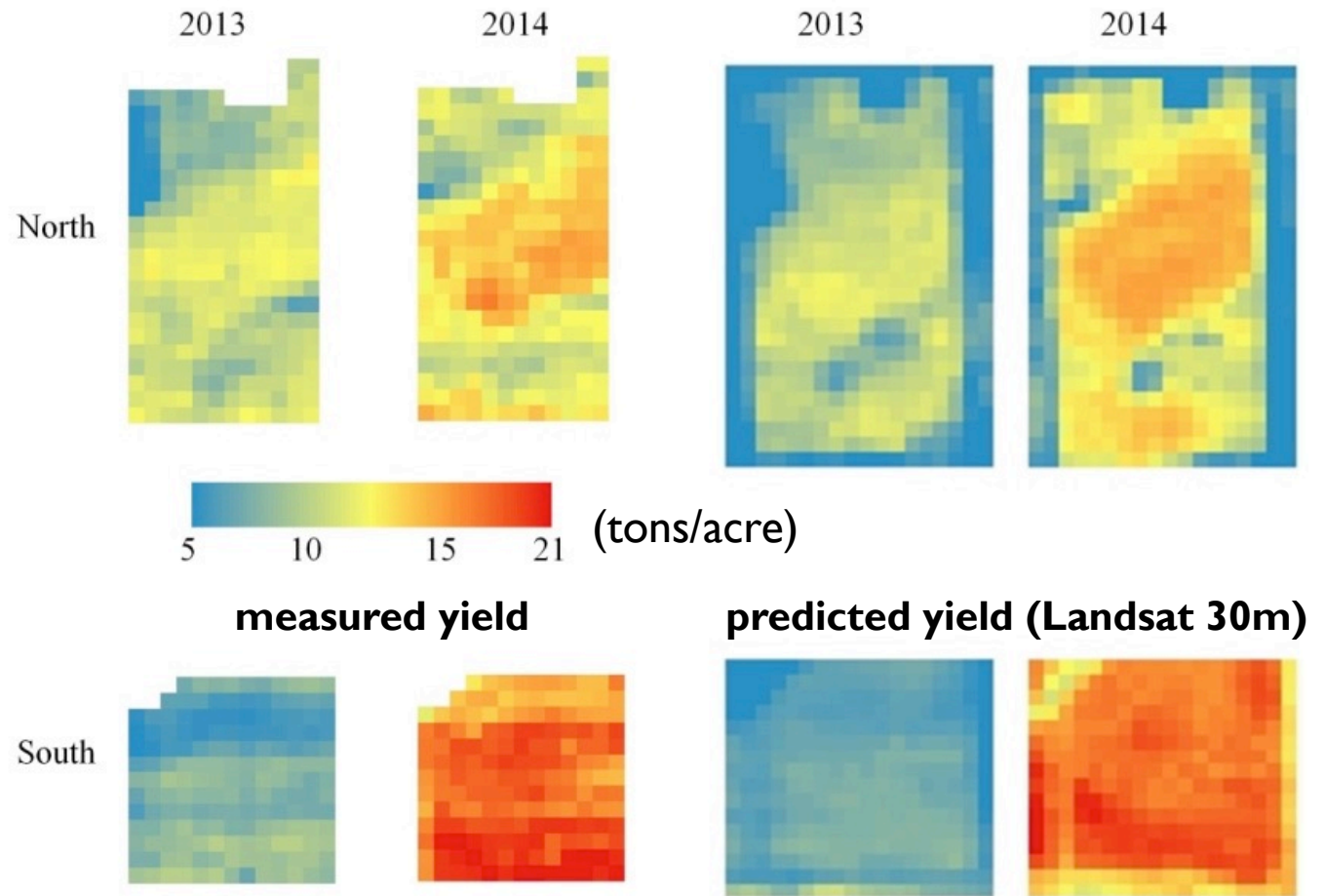


# Grape Yield Estimation





# Estimate Grape Yield at Gallo Vineyards (Lodi, CA) using Landsat and MODIS Data Products



- ❑ Grape yield depends on vine condition and management (e.g. pruning)
- ❑ Yield is harder to estimate but spatial variability are correlated to remote sensing observations
- ❑ Possible to predict yield with the help of limited field measurements

# Summary

## *Integrated System*

- STARFM data fusion
- DMS TIR image sharpener
- ALEXI/DisALEXI ET modeling
- LAI, Phenology ...

## *Validation and Applications*

- Crop phenology
- Daily crop water use and stress
- Drought Impact and early warning
- Yield estimation using time-series NDVI and ET (30m)

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